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# Type I conventional dendritic cells and CD8<sup>+</sup> T cells predict favorable clinical outcome of head and neck squamous cell carcinoma patients

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Head and neck squamous cell carcinoma (HNSCC) is one of the most common tumor entities worldwide, with human papillomavirus (HPV) infection contributing to cancer development. Conventional therapies achieve only limited efficiency, especially in recurrent or metastatic HNSCC. As the immune landscape decisively impacts the survival of patients and treatment efficacy, this study comprehensively investigated the immunological tumor microenvironment (TME) and its association with patient outcome, with special focus on several dendritic cell (DC) and T lymphocyte subpopulations. Therefore, formalin-fixed paraffin-embedded tumor samples of 56 HNSCC patients, who have undergone resection and adjuvant radiotherapy, were analyzed by multiplex immunohistochemistry focusing on the detailed phenotypic characterization and spatial distribution of DCs, CD8<sup>+</sup> T cells, and T-helper cell subsets in different tumor compartments. Immune cell densities and proportions were correlated with clinical characteristics of the whole HNSCC cohort and different HPV- or hypoxia-associated subcohorts. Tumor stroma was highly infiltrated by plasmacytoid DCs and T lymphocytes. Among the T-helper cells and CD8<sup>+</sup> T cells, stromal regulatory T cells and intraepithelial exhausted CD8<sup>+</sup> T cells expressing programmed cell death protein-1 (PD-1<sup>+</sup>) and/or lymphocyteactivation gene-3 (LAG-3<sup>+</sup>) were the predominant phenotypes, indicating an immunosuppressive TME. HPV-associated tumors showed significantly higher infiltration of type I and type II conventional DCs (cDC1, cDC2) as well as several CD8<sup>+</sup> T cell phenotypes including exhausted, activated, and proliferating T cells. On the contrary, tumors with hypoxia-associated gene signatures exhibited reduced infiltration for these immune cells. By multivariate Cox regression, immune-related prognostic factors were identified. Patient clusters defined by high infiltration of DCs and T lymphocytes combined with HPV positivity or low

hypoxia showed significantly prolonged survival. Thereby, cDC1 and CD8<sup>+</sup> T cells emerged as independent prognostic factors for local and distant recurrence. These results might contribute to the implementation of an immune cell infiltration score predicting HNSCC patients' survival and such patient stratification might improve the design of future individualized radiochemo-(immuno)therapies.

### KEYWORDS

dendritic cells, head and neck squamous cell carcinoma, human papilloma virus, hypoxia, multiplex imaging, spatial biology, T cells, tumor microenvironment

# 1 Introduction

With estimated 880,000 new cases and 450,000 deaths worldwide in 2020, head and neck squamous cell carcinoma (HNSCC) is the sixth most common tumor entity and incidences continue to rise, with a growing proportion of human papillomavirus (HPV)-infection driven tumors over the last decades (1). HNSCC includes tumors located in the oral cavity, oropharynx, hypopharynx, and larynx. Besides some well-known risk factors, such as extensive consumption of tobacco and alcohol, the infection with HPV (primarily genotype 16) causes carcinogenesis in roughly 25% of HNSCC, particularly in the oropharynx (> 70%), hence representing a major leading factor for HNSCC development (2).

Despite the advanced treatment regimen consisting of radical resection and adjuvant high-dose radio(chemo)therapy (R(C)Tx) or definite R(C)Tx in locally advanced HNSCC, the 5-year overall survival (OS) rate of 50-69% still can be improved (3). Moreover, limited prognosis also results from frequent local relapse occurring in up to 60% of HNSCC patients (4). The implementation of immunotherapy approaches, such as anti-programmed cell death protein-1 (anti-PD-1) antibodies, was intended to improve survival outcomes. However, this was noticeable only in 15-30% of HNSCC patients with recurrent or metastatic disease (5, 6). Several studies highlighted that HPV-associated (HPV+) oropharyngeal tumors are generally linked to an improved clinical outcome following R(C)Tx, compared to the HPV-negative (HPV-) ones. Hence, these HPV+ tumors constitute a distinct cancer entity (7, 8), with p16 upregulation being used as their corresponding marker in the 8<sup>th</sup> edition of tumor, node, metastasis (TNM) classification, even though the use of p16 overexpression alone as a prognostic and diagnostic marker needs further validation (9). Other parameters, including the combination of HPV-DNA/RNA and p16, hypoxia and hypoxia-induced gene expression, high expression of cancer stem cell markers, tumor volume, solute carrier family 3 member 2 (SLC3A2) and CD44 protein expression, have also been described as prognostic factors for local relapse after R(C)Tx in HNSCC (10). For instance, hypoxia-associated gene signatures or a hypoxic tumor

microenvironment (TME) are associated with reduced therapeutic efficacy and poor prognosis (11, 12).

Despite the utility of tumor localization, p16 status, and hypoxia in subgrouping HNSCC patients and predicting clinical outcome, there is still a high variability in treatment response. Therefore, novel biomarkers as well as improved tools to predict therapeutic success and individualize treatment modalities are urgently needed to optimize therapy efficacy, properly adjust therapeutic regimens, and prevent over- or under-treatment with side effects or treatment failure (13).

HNSCC is known to be an immunogenic tumor entity including a high tumor infiltration of myeloid and lymphoid cells (14). However, tumor cells generate an immunosuppressive microenvironment resulting, for instance, in enhanced infiltration of activated regulatory T cells ( $T_{regs}$ ) and generation of exhausted T cells (5). Thus, the tumor immune contexture comprising the frequency, spatial distribution, orientation, and functional characteristics of tumor-infiltrating immune cells plays a critical role for the clinical outcome of cancer patients (15, 16). A positive correlation between high densities of tumor-infiltrating T cell subsets, in particular CD8<sup>+</sup> T cells, and improved prognosis has been reported for various cancer entities, including HNSCC (15, 17). Additionally, dendritic cells (DCs) are known as key players of innate and adaptive immunity (18). DCs are clinically relevant, as demonstrated in various cancer entities (19, 20), and may also significantly impact the outcome of HNSCC patients (21). The function of cancerinfiltrating immune cells is dual and context-dependent, as they can either favor anticancer immunity or promote tumor tolerance. Hence, their role has to be described individually for each cancer entity and immune cell subtype (22). For instance, plasmacytoid DCs (pDCs), described as the main producers of type I interferon upon stimulation, can either participate in antitumor immunity and favorably impact clinical outcome (20), or they may adopt a tolerogenic phenotype and thereby contribute to poor prognosis (23). Other studies investigating the tumor immune architecture revealed that infiltrating T cells also significantly influenced the clinical efficacy of various treatments, including R(C)Tx (24, 25).

In HNSCC, the role of the immunological TME is subject of ongoing research. However, there are limited investigations exploring the tumor immune landscape in detail. So far, most studies have focused on detecting the presence of T cells using immunohistochemistry or bulk gene expression profiles of tumor samples (26–29). Several groups reported a positive impact of high densities of CD8<sup>+</sup> T cells on the survival and relapse of HNSCC patients (5, 27). Nonetheless, these previous studies generally lack a more detailed phenotypic description of infiltrating CD8<sup>+</sup> T lymphocytes in terms of their phenotype orientation, for instance by assessing the (co-)expression of activating and/or inhibitory markers, their localization relative to the tumor cells, and whether their spatial distribution impacts survival. Moreover, little is known about the infiltration pattern and clinical influence of distinct DC and T-helper (T<sub>H</sub>) subsets in HNSCC.

Here, we aimed to explore these unresolved issues by comprehensively investigating the presence and role of several tumor-infiltrating T cell subpopulations, two conventional DC subtypes (cDC1 and cDC2), as well as pDCs in more detail, characterizing their phenotype and spatial distribution in distinct compartments of HNSCC tissue samples by multiplex immunohistochemistry (mIHC). We correlated the densities and proportions of various immune cell subsets with clinical characteristics of the whole HNSCC cohort and different HPV- or hypoxia-associated subcohorts. In addition, we used survival parameters and clinicopathological characteristics of the patient cohort to identify immune cell types with an independent prognostic value. Thereby, we provide a more comprehensive picture of the HNSCC immune architecture supporting the identification of novel prognostic biomarkers for this cancer entity.

# 2 Materials and methods

## 2.1 Patients and study design

HNSCC patients were enrolled after the Ethics Committee of Technische Universität Dresden approved this retrospective analysis of clinical and biological data (No EK 397102014). Informed consent was given by patients before treatment. Eligible patients (n = 56) had histologically proven squamous cell carcinoma of the oral cavity or oropharynx in an advanced stage. All patients were treated with curatively intended radical R0 resection followed by adjuvant RTx between 09/2005 and 10/2016 with a total dose of 60-66 Gy, covering the tumor region and regional lymph nodes and including a boost to the tumor region and to positive lymph node levels according to standard protocols. Patients with p16+ tumors were included if they were also HPV-DNA or HPV-RNA positive, according to a method evaluated and described before (30). Clinicopathological characteristics of the patient cohort were summarized in Supplementary Table 1.

## 2.2 Biomarker analysis and immunohistochemical stainings

To assess clinicopathological parameters of the patient cohort, immunohistochemical staining of p16, DNA extraction and PCRarray based analyses of HPV status, as well as NanoString RNA analyses were conducted similar to other German Cancer Consortium (DKTK) cohorts, as described previously (10). Briefly, p16 overexpression (also called p16 positivity) was defined as  $\geq$  70% intense tumor staining using the immunohistochemical CINtec Histology kit (Roche mtm laboratories AG, Basel, Switzerland). Negative controls were included to confirm the positive stainings. HPV-DNA analysis was performed with the LCD-Array HPV 3.5 kit (CHIPRON GmbH, Berlin, Germany) following DNA extraction from 5 µm formalin-fixed paraffin-embedded (FFPE) sections with QIAamp DNA FFPE tissue kit (QIAGEN N.V., Venlo, Netherlands). Hypoxia status was determined by gene expression analysis, using the NanoString Elements technology (NanoString Technologies, Seattle, Washington, USA) and the previously established 15-gene hypoxia-associated signature (Hypox15) (31).

### 2.3 Multiplex immunohistochemistry

To detect tumor-infiltrating immune cell populations, mIHC of 3-5 µm FFPE tumor sections was performed using the tyramide signal amplification-based OPAL technology (Akoya Biosciences, Marlborough, Massachusetts, USA) on the Ventana Ultra Instrument (Ventana Medical Systems, Basel, Switzerland) as described before (32, 33). First, tissue sections were deparaffinized and rehydrated for 24 min at 69°C in EZ Prep solution (Ventana Medical Systems). Subsequently, heat-mediated antigen retrieval was performed for 32 min at 95°C in Cell Conditioning solution 1 (Ventana Medical Systems). Tissue sections were incubated with primary antibodies for 32 min (blood dendritic cell antigen-2 [BDCA-2], interferon regulatory factor 7 [IRF7], C-type lectin domain family 9 member A [CLEC9A], C-type lectin domain family 10 member A [CLEC10A], CD1c, CD3, CD8, granzyme B [GrzB], Ki67, forkhead box P3 [FoxP3], T-box expressed in T cells [T-bet], GATA binding protein 3 [GATA3], pan-cytokeratin [PanCK]) or 60 min (PD-1, LAG-3, RAR-related orphan receptor gamma [RORYT]) at 36°C. Next, anti-species secondary antibodies (OmniMAP HRP anti-rabbit, OmniMAP HRP anti-mouse, DISCOVERY anti-mouse HQ, Ventana Medical Systems) and optionally tertiary antibodies (DISCOVERY anti-HQ HRP) were added to the tissues for 12 min at 36°C. Finally, tissues were incubated with Opal fluorophores (Akoya Biosciences) for 8 min at room temperature. Antibodies were stripped by heating the samples in Cell Conditioning solution 2 (Ventana Medical Systems) for 24 min at 100°C (8 min for PanCK in the DC panel). Antibody incubation was repeated sequentially for all antibodies of the panel. Staining procedure was finalized by counterstaining with DAPI (Merck KGaA, Darmstadt, Germany). Tissues were mounted in Fluoromount-G® medium (SouthernBiotech, Birmingham, Alabama, USA).

In total, three different antibody panels were stained allowing for the detection of five distinct immune cell marker in addition to the tumor marker PanCK and DAPI nuclear stain (Supplementary Table 2). To assess the phenotype and frequency of DCs, a panel consisting of CLEC9A (cDC1), CD1c and CLEC10A (both for cDC2), BDCA-2 (pDCs), and the transcription factor (TF) IRF7 (activation marker for pDC, nuclear expression) was stained. To differentiate several functional phenotypes of cytotoxic T cells, the second mIHC panel comprised the lineage marker CD8, the inhibitory immune checkpoints LAG-3 and PD-1, the activation marker GrzB, and the proliferation marker Ki67. Lastly, to analyze the proportion of  $T_H$  subtypes a panel with the lineage marker CD3 and the TFs T-bet ( $T_H1$  cells), GATA3 ( $T_H2$  cells), ROR $\gamma T$  ( $T_H17$  cells), and FoxP3 ( $T_{regs}$ ) was stained. Detailed information about the antibody panels are summarized in Supplementary Table 2.

### 2.4 Image analysis and cell quantification

Images were acquired by the Vectra 3.0 Automated Imaging System (Akoya Biosciences). Randomly set multiplex images were taken at 200× magnification in a 25% coverage of the whole tumor area (WTA, Supplementary Figure 1). Image data was processed with the inForm® software (Akoya Biosciences) using a semi-automatic approach. Algorithms were trained to differentiate tissue from nontissue, and epithelial from stromal tissue based on PanCK positivity (Supplementary Figure 2A). Cells were segmented based on DAPI staining and phenotyped based on the signal intensity of the respective marker (Supplementary Figures 2B-D). Reliable performance of the trained algorithms was tested and validated on separate sets of randomly selected images. Raw data was processed and prepared for subsequent statistical analysis using RStudio and R v4.3.2 (34) with the packages phenoptr (35) and phenoptrReports (36). Immune cells were quantified by calculating cell densities (cells/mm<sup>2</sup>) and resultant proportions. For the DC subtypes as well as CD3<sup>+</sup> and CD8<sup>+</sup> T cells, the cell density was used for analysis, while functional CD8<sup>+</sup> T cell phenotypes and T<sub>H</sub> subtypes were analyzed as percentage of all CD8<sup>+</sup> T cells and TF<sup>+</sup> CD3<sup>+</sup> T cells, respectively. Multi-channel TIFFs of representative images were processed by applying arithmetic point operations using the ImageJ software (37).

### 2.5 Statistical analysis

Immune cell infiltrates were assessed for the spatial compartments tumor stroma (TS), intraepithelial PanCK<sup>+</sup> tumor (IET) and WTA, which combines both, TS and IET. To assess significant differences between immune cell frequencies and proportions of the TS and IET compartments, the Mann-Whitney-U test was used. For all analyses performed, p-values < 0.05 were considered statistically significant. Furthermore, immune cell infiltrates were compared between patient subgroups stratified by clinicopathological characteristics (tumor grading, p16 status, hypoxia) for the whole HNSCC cohort, as well as for HPV-, and hypoxia-associated subcohorts (clinical characteristics of subcohorts in Supplementary Tables 3, 4). Statistical differences between subgroups were assessed by performing the Mann-Whitney-U test. Resulting p-values were visualized with a heatmap using a color code from faint (non-significant) to intensely colored (significant, p-value < 0.05), with red representing a higher infiltration in tissues classified as grading 3 (G3), p16+, or hypoxia<sup>high</sup> and blue encoding the opposite. As the heatmap gives no information about the data distribution, significant correlations were visualized as scatter dot plots (median with 95% confidence interval [CI]) separately. Potential clinical impact of HNSCC-infiltrating DCs, CD8<sup>+</sup> T cells, and T<sub>H</sub> subsets on OS, locoregional control (LRC), and control of locoregional recurrence and distant metastasis (LDMC) was explored for each of the three spatial compartments using Kaplan-Meier analysis with Log-rank test. Clinical endpoints OS, LRC, and LDMC were defined as the time interval between the first day of radiotherapy and the date of the event or last follow up (10, 30). The median density of each cell phenotype was used as cutoff between high ( $\geq$  median) and low infiltration (< median) subgroups. Log-rank p-values of Kaplan-Meier analysis were visualized using a heatmap that depicts the significant p-values (p < 0.05) in intense colors, where red represents that high infiltration improves the considered endpoint and blue encodes the opposite. For significant associations, Kaplan-Meier graphs are shown in addition to the heatmaps. Furthermore, immune cell populations and clinical parameters (tumor localization, p16 status, T stage) being significant in univariate setting were analyzed by multivariate Cox regression. All statistical analyses and visualization of the heatmaps were performed with Python 3.7.10 (Wilmington, Delaware, USA) using the lifelines and matplotlib packages. For visualization of scatter dot plots and Kaplan-Meier graphs, GraphPad Prism 9.4.1 (Boston, Massachusetts, USA) was used. Forest plots were created using the package forplo (38) with RStudio and R v4.3.2 (34).

# **3** Results

# 3.1 pDCs, $T_{\rm regs}$ , PD-1<sup>+</sup>CD8<sup>+</sup>, and LAG-3<sup>+</sup>CD8<sup>+</sup> T cells dominate immune landscape of HNSCC

For the phenotypic and spatial characterization of HNSCCinfiltrating immune cell populations, mIHC was applied to a cohort of 56 primary HNSCC patients that have undergone resection and adjuvant RTx. FFPE tissue slices were stained with three antibody panels to detect different DC subsets (cDC1, cDC2, pDCs), functional CD8<sup>+</sup> T cell phenotypes (activated, proliferative, exhausted), and T<sub>H</sub> subtypes based on the TFs T-bet (T<sub>H</sub>1 cells), GATA3 (T<sub>H</sub>2 cells), ROR $\gamma$ T (T<sub>H</sub>17 cells), and FoxP3 (T<sub>regs</sub>). Representative images of these antibody panels are depicted in Figures 1A–C.

As the immunohistochemical staining allows to detect immune cells in their physical position within the original specimen, we compared the frequency of all infiltrated immune cell populations that are retrievable from the stained panels (Figure 2A) between the TS and the IET of all 56 HNSCC patients. The TS is defined as PanCK<sup>-</sup> tissue regions in between the PanCK<sup>+</sup> tumor bed termed as IET (Figure 1). Immune cell frequencies in the WTA (TS and IET combined) are shown in Supplementary Figure 3. In the DC population, pDCs represent the prevailing DC subtype in the WTA and the TS with a cell number of 39.1 cells/mm<sup>2</sup> and



#### FIGURE 1

active pDC: IRF7<sup>+</sup>BDCA-2<sup>+</sup>, cDC1: CLEC9A<sup>+</sup>, cDC2: CLEC10A<sup>+</sup>CD1c<sup>+</sup>), (**B**) CD8<sup>+</sup> T cell subtypes (inhibitory markers: LAG-3 and PD-1, cytotoxic marker: GrzB, proliferation marker: Ki67), and (**C**) T-helper cell subtypes (Treg: FoxP3<sup>+</sup>CD3<sup>+</sup>, T<sub>H</sub>1: T-bet<sup>+</sup>CD3<sup>+</sup>, T<sub>H</sub>2: GATA3<sup>+</sup>CD3<sup>+</sup>, T<sub>H</sub>17: RORYT\*CD3\*). Intraepithelial tumor cells and nuclei are visualized by PanCK and DAPI staining, respectively. White dashed line indicates separation of tumor stroma (TS) and intraepithelial tumor (IET) compartments. Scale bars indicate 30 µm.

79.8 cells/mm<sup>2</sup>, respectively (Figure 2B; Supplementary Figure 3). Hence, pDCs were at least 4- or 6-times more abundant than cDC1 or cDC2. Comparing the densities of total pDCs, activated pDCs (nuclear IRF7<sup>+</sup>), and cDC1 between TS and IET, a significantly higher infiltration of the TS was observed for all three phenotypes, while cDC2 showed no difference between both tissue regions (Figure 2B). Furthermore, both CD3<sup>+</sup> and CD8<sup>+</sup> T cells were found in the TS (1696.9 CD3<sup>+</sup> cells/mm<sup>2</sup> and 765.3 CD8<sup>+</sup> cells/mm<sup>2</sup>) in significantly higher numbers compared to the IET (353.6 CD3<sup>+</sup> cells/mm<sup>2</sup> and 184.2 CD8<sup>+</sup> cells/mm<sup>2</sup>, Figure 2C). Regarding the  $T_{\rm H}$  cell composition,  $T_{\rm regs}$  accounted for the largest proportion of total TF<sup>+</sup> CD3<sup>+</sup> T cells in both tumor regions with 79.5% in the TS and 66.3% in the IET. Comparing the spatial distribution of  $T_{\rm H}$  cells, a significantly higher proportion of  $T_{\rm H}1$ 



Quantified immune cell infiltration of tumor stroma (TS) and intraepithelial tumor (IET) compartments of the whole HNSCC cohort. (A) Biomarker classification used to identify several immune cells and subpopulations according to additional functional markers. Frequency of (B) DCs and (C)  $CD3^+$  (left) and  $CD8^+$  T cells (right). (D) Proportion of T<sub>H</sub> subpopulations on total T cells expressing any transcription factor (TF). (E) Proportion of CD8 subpopulations expression further functional markers on total CD8<sup>+</sup> T cells. Median with 95% confidence interval (CI), median values shown below dots, Mann-Whitney test, \*\*\*p < 0.001, \*\*p < 0.01, \*p < 0.05.

cells was observed in the IET, while  $T_{regs}$ ,  $T_{H2}$  cells, and  $T_{H17}$  cells infiltrated the TS in a higher density (Figure 2D). Regarding functional CD8<sup>+</sup> phenotypes, LAG-3<sup>+</sup>CD8<sup>+</sup> T cells represented the highest proportion in both tumor regions with 22.2% in the TS and 45.2% in the IET (Figure 2E), followed by PD-1<sup>+</sup>CD8<sup>+</sup>, proliferative Ki67<sup>+</sup>CD8<sup>+</sup>, and potentially impaired/exhausted (PD-1<sup>+</sup>LAG-3<sup>+</sup>CD8<sup>+</sup>) T cells. We further examined the ratio of CD8<sup>+</sup> T cells to  $T_{regs}$  with values > 1 indicating a higher CD8<sup>+</sup> T cell infiltration. This ratio gives a simplified insight whether potential cytotoxic or immunosuppressive T cells prevail in the TME. However, we observed no significant difference between TS and IET while the CD8: $T_{reg}$  ratio tended to be higher in the IET (Figure 2F). Taking together, the immunological TME of HNSCC is characterized by high frequencies of pDCs,  $T_{regs}$ , and CD8<sup>+</sup> T

cells in the stromal compartment, whereby  $CD8^+$  T cells exhibited an exhausted phenotype (PD-1<sup>+</sup> and/or LAG-3<sup>+</sup>) predominantly in the IET.

# 3.2 p16+ HNSCC exhibit high immune infiltration while hypoxic conditions reveal reduced immune cell infiltration

To assess a potential link between immune infiltrates and clinical parameters, we analyzed the frequency of HNSCC-infiltrating DCs and T cells with regard to tumor grading (G2 vs. G3), p16 positivity (p16 negative vs. p16 positive), and hypoxia (low vs. high expression of Hypox15 gene signature). We examined the

whole cohort of 56 HNSCC patients (Figure 3) and additionally compared the p16-/p16+ subcohorts (Figure 4) and the  $Hypox15^{low}/Hypox15^{high}$  subcohorts (Figure 5).

In the whole cohort, only  $T_H 17$  cells (ROR $\gamma T^+CD3^+$ ) in the TS correlated positively with a higher tumor grading, which was not

observed in the IET (Figures 3A, B). Regarding the biomarker analysis, p16 positivity was largely associated with a higher immune infiltration. In both locations, TS and IET, the density of cDC1, CD3<sup>+</sup>, and CD8<sup>+</sup> T cells as well as the proportion of  $T_H2$  cells (GATA3<sup>+</sup>CD3<sup>+</sup>) and the CD8: $T_{reg}$  ratio was significantly increased in



### FIGURE 3

Quantified immune cell infiltration of tumor stroma (TS) and intraepithelial tumor (IET) compartments with respect to certain clinical parameters of the whole HNSCC cohort. (A) Calculated p-values (Mann-Whitney test) are depicted in the heatmap (red indicates higher immune cell frequencies in G3/p16+/Hypoxia high subcohorts; blue indicates higher immune cell frequencies in G2/p16-/Hypoxia low subcohorts; color intensity indicates significance level) and (B) in case of a significant difference in at least one compartment, TS and IET data were shown in separate dot plots (median with 95% confidence interval [CI], significant p-values [p < 0.05] printed in bold; TF, transcription factor).



Quantified immune cell infiltration of tumor stroma (TS) and intraepithelial tumor (IET) compartments with respect to certain clinical parameters of p16+ and p16- subcohorts. (A) Calculated p-values (Mann-Whitney test) are depicted in the heatmap (red indicates higher immune cell frequencies in G3/Hypoxia high subcohorts; blue indicates higher immune cell frequencies in G2/Hypoxia low subcohorts; color intensity indicates significance level) and (B) in case of a significant difference in at least one compartment, TS and IET data were shown in separate dot plots (median with 95% confidence interval [CI], significant p-values [p < 0.05] printed in bold; TF, transcription factor).

p16+ HNSCC. In addition, several functional CD8<sup>+</sup> T cell subpopulations showed a significantly higher proportion in the TS of p16+ tumors (PD-1<sup>+</sup>CD8<sup>+</sup>, PD-1<sup>+</sup>LAG-3<sup>+</sup>CD8<sup>+</sup>, PD-1<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup>, PD-1<sup>+</sup>Ki67<sup>+</sup>CD8<sup>+</sup>), while cDC2 were positively correlated to p16 overexpression only in the IET (Figures 3A, B). A high expression of hypoxia-related genes was associated with a significantly decreased cDC1 infiltration in the IET and a significantly smaller proportion of functional CD8<sup>+</sup> subtypes (GrzB<sup>+</sup>CD8<sup>+</sup>, LAG-3<sup>+</sup>GrzB<sup>+</sup> CD8<sup>+</sup>, GrzB<sup>+</sup>Ki67<sup>+</sup>CD8<sup>+</sup>) in the TS (Figures 3A, B).

Analyzing the p16+ and the p16- subcohorts, we found that the clinicopathological parameters tumor grading or hypoxia status seem to have no significant effect on the frequencies of DCs and T cells in the TS and IET compartments of p16- tumors (Figure 4A). In contrast, in the WTA of the p16- subcohort, activated GrzB<sup>+</sup>CD8<sup>+</sup> and proliferating Ki67<sup>+</sup>CD8<sup>+</sup> T cells with or without the expression of LAG-3 showed a significantly lower proportion in Hypox15<sup>high</sup> tumors (Supplementary Figure 5). In the p16+ subcohort, a significantly higher proportion of T<sub>H</sub>17 cells (ROR $\gamma$ T<sup>+</sup>CD3<sup>+</sup>) was observed in the TS of G3 compared to G2 HNSCC (Figures 4A, B). Additionally, a high hypoxia-related gene

expression was associated with less infiltrates of cDC1, CD3<sup>+</sup>, and CD8<sup>+</sup> T cells as well as a decreased proportion of LAG-3<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup> T cells in both tumor areas (Figures 4A, B). Interestingly, under hypoxic conditions, p16+ tumors exhibited a significantly decreased proportion of T<sub>H</sub>1 cells (T-bet<sup>+</sup>CD3<sup>+</sup>) combined with increased numbers of immunosuppressive T<sub>regs</sub> (FoxP3<sup>+</sup>CD3<sup>+</sup>). In line with this observation, the CD8:T<sub>reg</sub> ratio was lower in Hypox15<sup>high</sup> tumors (Figures 4A, B).

Comparing the hypoxia-stratified subcohorts, clinicopathological parameters (tumor grading and p16 status) had a greater influence on the immune cell infiltrate in tumors with a low compared to tumors with a high Hypox15 gene cluster expression (Figure 5A). While tumor grading had no significant effect in the Hypox15<sup>high</sup> subcohort, G3 HNSCC were significantly associated with increased proportions of PD-1<sup>+</sup>LAG-3<sup>+</sup>CD8<sup>+</sup> T cells in the IET and T<sub>H</sub>17 cells (ROR $\gamma$ T<sup>+</sup>CD3<sup>+</sup>) in the TS of the Hypox15<sup>low</sup> cohort (Figures 5A, B). Furthermore, Hypox15<sup>low</sup> p16+ tumors exhibited an increased infiltration of cDC1, CD3<sup>+</sup>, and CD8<sup>+</sup> T cells and had significantly higher proportions of PD-1<sup>+</sup>CD8<sup>+</sup>, PD-1<sup>+</sup>LAG-3<sup>+</sup>CD8<sup>+</sup>, and PD-1<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup> T cells in the TS. Additionally, these tumors were characterized by high proportions of T<sub>H</sub>2 cells (GATA3<sup>+</sup>CD3<sup>+</sup>) and a high CD8:T<sub>reg</sub> ratio (Figures 5A, B).



In contrast, Hypox15<sup>high</sup> p16+ tumors exhibited a significantly decreased amount of  $T_{\rm H1}$  cells (T-bet<sup>+</sup>CD3<sup>+</sup>), while few functional CD8<sup>+</sup> phenotypes showed significantly higher values in these tumors (Ki67<sup>+</sup>CD8<sup>+</sup> T cells in IET, PD-1<sup>+</sup>Ki67<sup>+</sup>CD8<sup>+</sup> T cells in TS, Figures 5A, C). In general, p16 positivity was associated with increased frequencies of several DC and T cell subpopulations, whereas hypoxia correlated with opposite effects. These infiltration patterns were not only recognizable in the whole cohort but also in p16+ and Hypox15<sup>low</sup> subcohorts.

# 3.3 Prognostic association of immune cells is dependent on biomarker subgrouping

To specifically determine the influence of HNSCC-infiltrating DC and T cell subpopulations on clinical outcome, we evaluated different clinical parameters (OS, LRC, LDMC) in the whole cohort of 56 HNSCC patients (Figure 6) as well as in subcohorts stratified by p16 overexpression and hypoxia-related gene expression (Figures 7, 8).



Quantified immune cell infiltration of tumor stroma (TS) and intraepithelial tumor (IET) compartments with respect to survival parameters of the whole HNSCC cohort. (A) Calculated p-values (Log-rank test) are depicted in the heatmap (red indicates a positive association of survival probabilities with tumor infiltration; blue indicates a negative association of survival probabilities with tumor infiltration; color intensity indicates significance level) and (B) in case of a significant difference in at least one compartment, TS and IET data were shown in separate Kaplan-Meier curves (significant p-values [p < 0.05] printed in bold).

In the whole cohort, a significant positive correlation with OS was observed only for LAG-3<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup> T cells (Figures 6A, B). In addition, a high CD8:T<sub>reg</sub> ratio was associated with a decreased risk of local recurrence and distant metastases (LRC and LDMC) of HNSCC (Figures 6A, B). Of note, these prognostic correlations were only observed in the TS, while immune cells in the IET had no prognostic value in the whole cohort (Figure 6A). In contrast, when considering TS and IET compartments together (WTA), high infiltration of T cells (CD3<sup>+</sup> and CD8<sup>+</sup>) as well as cDC1 were significantly associated with a longer recurrence-free period (LRC and LDMC, Supplementary Figure 4). Moreover, high numbers of PD-1<sup>+</sup>LAG-3<sup>+</sup>CD8<sup>+</sup> T cells correlated significantly with a longer OS (Supplementary Figure 4).

p16+ HNSCC and tumors located in the oropharynx are generally associated with better treatment response (8, 9). The comparison of p16- and p16+ subcohorts revealed that the analyzed immune cells in TS or IET compartments of the p16+ cohort had less significant prognostic associations than the p16-

cohort (Figure 7A). In the p16- cohort, HNSCC with high CD8<sup>+</sup> T cell infiltrates in the IET displayed significantly lower LDMC, which was observed as a trend for LRC (Figures 7A, B). Furthermore, p16-HNSCC with a high stromal proportion of activated GrzB<sup>+</sup>CD8<sup>+</sup> T cells and LAG-3<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup> T cells showed a significant negative correlation with disease progression (LRC and LDMC) and a higher frequency of  $T_H17$  cells (ROR $\gamma$ T<sup>+</sup>CD3<sup>+</sup>) was associated with longer OS and LDMC in these tumors (Figures 7A, B). In addition,  $T_{regs}$  also showed a positive correlation with longer OS in the WTA (Supplementary Figure 5). In contrast, in p16+ HNSCC only increased proportions of proliferating Ki67<sup>+</sup>CD8<sup>+</sup> T cells in the IET were significantly associated with shorter OS (Figures 7A, C).

Regarding the hypoxia-subcohorts, a high frequency of activated pDCs (IRF7<sup>+</sup> pDCs) in the TS was significantly associated with a shorter OS and LDMC in the Hypox15<sup>low</sup> subcohort (Figures 8A, B). Additionally, Hypox15<sup>low</sup> tumors with high proportions of PD-1<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup> T cells and LAG-3<sup>+</sup>GrzB<sup>+</sup> T cells in the IET showed positive outcomes regarding OS/LRC and



Quantified immune cell infiltration of tumor stroma (TS) and intraepithelial tumor (IET) compartments with respect to survival parameters of p16+ and p16- subcohorts. (A) Calculated p-values (Log-rank test) are depicted in the heatmap (red indicates a positive association of survival probabilities with tumor infiltration; blue indicates a negative association of survival probabilities with tumor infiltration; color intensity indicates significance level) and in case of a significant difference in at least one compartment, TS and IET data were shown in separate Kaplan-Meier curves for (B) p16- and (C) p16+ subcohorts (significant p-values [p < 0.05] printed in bold).

OS, respectively (Figures 8A, B). Moreover, a high CD8: $T_{reg}$  ratio in the IET compartment of these tumors was indicative for a significantly higher LRC (Figures 8A, B), which was also observed when analyzing the WTA (Supplementary Figure 6). Likewise, the negative association between activated pDCs (IRF7<sup>+</sup> pDCs) and LDMC persist for the WTA, while also high pDC numbers were significantly associated with a shorter OS (Supplementary Figure 6). In contrast, high cDC1, CD3<sup>+</sup>, and CD8<sup>+</sup> T cell infiltration were prognostic for a significantly longer recurrence-free period in the WTA of Hypox15<sup>low</sup> tumors (LRC and LDMC, Supplementary Figure 6). In Hypox15<sup>high</sup> HNSCC, several CD8<sup>+</sup> T cell phenotypes were significantly associated with worse prognosis. A high



#### FIGURE 8

Quantified immune cell infiltration of tumor stroma (TS) and intraepithelial tumor (IET) compartments with respect to survival parameters of Hypox15 high and Hypox15 low subcohorts. (A) Calculated p-values (Log-rank test) are depicted in the heatmap (red indicates a positive association of survival probabilities with tumor infiltration; blue indicates a negative association of survival probabilities with tumor infiltration; blue indicates a negative association of survival probabilities with tumor infiltration; color intensity indicates significance level) and in case of a significant difference in at least one compartment, TS and IET data were shown in Kaplan-Meier curves for (B) Hypox15 low and (C) Hypox15 high subcohorts (significant p-values [p < 0.05] printed in bold).

proportion of activated GrzB<sup>+</sup>CD8<sup>+</sup> T cells in the TS was associated with a higher risk of recurrence (LRC and LDMC, Figures 8A, C). For LRC, this was also observed for PD-1<sup>+</sup>GrzB<sup>+</sup> T cells and LAG-3<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup> T cells in the IET. Only LAG-3<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup> T cells in the TS were additionally predictive for shorter OS in Hypox15<sup>high</sup> cohort (Figures 8A, C). In addition to T cells, high frequencies of cDC2 were predictive of a high LDMC when analyzing the whole tumor of Hypox15<sup>high</sup> HNSCC (Supplementary Figure 6).

After analyzing whether p16 or hypoxia status of HNSCC patients has an influence on the infiltration of individual immune cells in several tumor compartments and whether this has an impact on the clinical outcome, the influence of several DC subsets in combination with T cells on patient survival was examined. This allows a more detailed patient classification and provides possible starting points for further research aiming at novel therapeutic approaches. Therefore, we clustered the subcohorts stratified by p16

positivity and hypoxia-related gene expression separately according to high or low immune cell infiltrate generating four different clusters for each subcohort (Figures 9A, C). In order to encompass several immune cell types, the clustering was based on densities of pDCs, cDC1, cDC2, CD3<sup>+</sup>, and CD8<sup>+</sup> T cells in WTA (TS and IET together). Patients with p16+ HNSCC having significantly improved clinical outcome compared to patients with p16- tumors (Supplementary Figure 7), showed these favorable clinical results especially in combination with high immune cell infiltrate (Figure 9B). In comparison to both p16-



### FIGURE 9

Combined p16/immune- and Hypox15/immune-phenotypes for HNSCC patient stratification in terms of clinical outcome. (A) Heatmaps of p16- (left) and p16+ (right) subcohorts clustering in two groups each according to low (blue) or high (red) immune cell infiltration by pDCs, cDC1, cDC2, CD3<sup>+</sup>, and CD8<sup>+</sup> T cells. (B) Kaplan-Meier curves depict clinical outcome (OS, LRC, LDMC) for HNSCC patients with p16+/immune<sup>high</sup>, p16+/immune<sup>high</sup>, or p16-/immune<sup>low</sup> phenotypes. (C) Heatmaps of Hypox15<sup>low</sup> (left) and Hypox15<sup>high</sup> (right) subcohorts clustering in two groups each according to low (blue) or high and Hypox15<sup>high</sup> (right) subcohorts clustering in two groups each according to low (blue) or p16-/immune<sup>high</sup>, or p16-/immune<sup>low</sup> phenotypes. (C) Heatmaps of Hypox15<sup>high</sup>/immune<sup>high</sup>, and CD8<sup>+</sup> T cells. (D) Kaplan-Meier curves depict clinical outcome (OS, LRC, LDMC) for HNSCC patients with Hypox15<sup>high</sup>/immune<sup>high</sup>, and CD8<sup>+</sup> T cells. (D) Kaplan-Meier curves depict clinical outcome (OS, LRC, LDMC) for HNSCC patients with Hypox15<sup>high</sup>/immune<sup>high</sup>, Hypox15<sup>high</sup>/immune<sup>low</sup>, Hypox15<sup>low</sup>/immune<sup>high</sup>, or Hypox15<sup>low</sup>/immune<sup>low</sup> phenotypes. p-values calculated by Log-rank test and adjusted using Benjamini-Hochberg method, significant p-values shown in bold print.

clusters, significant differences were visible for p16+/immune<sup>high</sup>, but not for p16+/immune<sup>low</sup>. In terms of combined hypoxia/ immune phenotypes, it became obvious that particularly patients with Hypox15<sup>low</sup> tumors and a high immune cell infiltrate depict the best survival and, in turn, patients with Hypox15<sup>high</sup>/ immune<sup>low</sup>-classified tumors showed the worst outcomes (Figure 9D). Although patients with Hypox15<sup>low</sup> tumors have a significantly prolonged OS compared to patients with Hypox15<sup>high</sup> tumors (Supplementary Figure 7), the additional inclusion of immune cell infiltrate for further subclassification shows a trend towards improved clinical outcome by high immune cell infiltrate.

# 3.4 cDC1 and CD8<sup>+</sup> T cells independently predict outcome of HNSCC patients

Additionally, DC and T cell subpopulations were tested in a multivariate setting to obtain immune markers that can serve as independent prognostic factors for HNSCC. Therefore, Cox regression was used to evaluate the prognosis of infiltrating immune cells in relation to different clinical parameters (Figure 10A; Supplementary Figures 8, 9; Supplementary Table 5). The clinical parameters and immune cell subtypes used for multivariate analysis were chosen based on a significant prognosis in the univariate setting. As the establishment of new prognostic biomarkers should be easily transferable into clinical procedures, we performed the multivariate analysis for the WTA as a differentiation into TS and IET may not be feasible in routine diagnostics. We observed that a high density of cDC1 is a prognostic factor for higher LRC and LDMC in the whole cohort, independent of tumor location (oropharynx vs. oral cavity), p16 positivity, and tumor stage (T1/T2 vs. T3/T4 according to TNM staging, Figure 10A; Supplementary Figure 8). Analyzing the T cell subpopulations, a high density of CD8<sup>+</sup> T cells was independently associated with a longer recurrence-free period (LRC and LDMC) in the whole HNSCC cohort (Figure 10A; Supplementary Figure 8). Furthermore, the proportion of activated GrzB<sup>+</sup>CD8<sup>+</sup> T cells was significantly associated with a higher risk of recurrence (LRC and LDMC) in patients with p16- HNSCC, independent of tumor staging (Supplementary Figure 9). In HNSCC with high hypoxiarelated gene expression, a high proportion of PD-1+GrzB+CD8+ T cells correlated significantly with a shorter OS and LDMC, independent of tumor location and tumor staging (Supplementary Figure 9). In addition, the ratio of CD8<sup>+</sup> T cells to Tregs seemed to has an independent prognostic value, as a higher CD8:Treg ratio was significantly associated with a decreased risk of local and distant recurrence (LDMC) in the whole cohort and the Hypox15<sup>low</sup> subcohort (Figure 10A; Supplementary Figure 9).

Since two immune cell types, in particular cDC1 and CD8<sup>+</sup> T cells, stood out in their favorable prognosis for the whole HNSCC cohort, we developed an immune cell infiltration score (ICIS) based on the frequency of both cell types in the WTA (Figure 10B). To generate the ICIS, a binary code was applied to each cell type that was based on the median cell density (density  $\geq$  median = 1, density < median = 0). By summarizing the binary code for both cell types, a classification system was obtained that consisted of three stages: 0 –

cell density of both markers is below median, 1 – cell density of only one marker is above median, 2 – both cell densities are above median. When stratifying the patient cohort according to the ICIS (0 vs. 1/2) we observed that an ICIS of 1 to 2, reflecting a high infiltration of cDC1 and/or CD8<sup>+</sup> T cells, was significantly associated with a higher LRC and highly significant in predicting a high LDMC (Figure 10B). Furthermore, a higher ICIS showed a strong trend for the prediction of prolonged OS (Figure 10B).

# 4 Discussion

The significant influence of the immune landscape on tumor development, progression, as well as on therapeutic outcome, has been described for many solid cancers, including HNSCC. By using conventional hematoxylin and eosin (H&E) whole slide stainings, Ribbat-Idle et al. showed that the immune infiltration pattern is an independent prognostic factor for OS of HNSCC patients, with "cold" tumors being significantly associated with worse clinical outcome in comparison to "hot" and "excluded" tumors (39). Whereas CD8<sup>+</sup> T cell infiltration in general indicates a positive prognosis in HNSCC, T<sub>H</sub> subpopulations, DC subtypes, and CD8<sup>+</sup> T cells expressing further co-stimulatory/-inhibitory marker proteins lack prognostic evaluation, so far (40, 41).

In our study, we investigated the tumor infiltration pattern of several immune cell subpopulations in different tumor compartments. Regarding DC subtypes, predominant pDCs were significantly more abundant in TS than in IET tissue compartment, whereby only minor frequencies of mature and/or activated pDCs (IRF7<sup>+</sup> pDCs) were identified. In general, HNSCC samples exhibited eightfold higher pDC infiltration in comparison to primary resected colon cancer and pancreatic ductal adenocarcinoma samples in our previous studies using similar BDCA-2 staining procedures (23, 42). Especially in HNSCC, the hypoxic TME seems to inhibit pDC maturation (43). Koucký et al. demonstrated a colocalization of functionally impaired pDCs with T<sub>regs</sub> in TS and reported a selective pDC-fostered T<sub>reg</sub> expansion (44). When looking at T cell subpopulations in our HNSCC cohort, T<sub>regs</sub> represented the major T<sub>H</sub> cell subset, with their predominant stromal distribution confirming current literature (45) and may contributing to the mentioned relation of pDCs and T<sub>regs</sub>. With respect to further T<sub>H</sub> subsets, T<sub>H</sub>1 cells were more common than T<sub>H</sub>2 cells or T<sub>H</sub>17 cells and significantly more frequent in IET than in TS. Although the development of HNSCC is thought to be accompanied by a switch from  $T_H1$ - to  $T_H2$ -cytokines (46), a CD8<sup>+</sup>rich TME seems to be linked to a T<sub>H</sub>1-dominated immune response (47). Using The Cancer Genome Atlas (TCGA) datasets of HNSCC patients, Lu et al. found an increased level of T<sub>H</sub>1 cells in a subcohort with a high abundance of  $\gamma\delta T$  cells, being in turn associated with a longer OS (48). Due to the limited number of marker molecules that can be simultaneously analyzed in one staining panel using our mIHC method, we have chosen CD3 for T cell detection and various major TFs (T-bet, GATA3, RORYT, and FoxP3) for evaluating the proportion of the most common  $T_{\rm H}$ subsets (T<sub>H</sub>1 cells, T<sub>H</sub>2 cells, T<sub>H</sub>17 cells, T<sub>regs</sub>). Therefore, rare  $CD8^+$  T cells (T<sub>C</sub>1, T<sub>C</sub>2, T<sub>C</sub>17) expressing one of these TFs may



infiltration of cDC1 and CD8<sup>+</sup> immune cells. Heatmap shows ICIS for each patient included within the study and Kaplan-Meier curves depict clinical outcome (OS, LRC, LDMC) for patients with ICIS = 0 vs. ICIS = 1 or ICIS = 2 (p-values calculated by Log-rank test, significant p-values [p < 0.05] printed in bold).

contribute to the proportion of positively stained TF-expressing CD3<sup>+</sup> T cells in our study. In this context,  $T_C1$ ,  $T_C2$ , and  $T_C17$  cells have been found in peripheral blood (49) or tumor draining lymph nodes (50) of HNSCC patients by flow cytometry. These studies discriminated the subpopulations based on the cytokine expression profiles without analyzing TF expression. However, CD8<sup>+</sup> T<sub>C</sub> subsets were less frequent than CD4<sup>+</sup> T<sub>H</sub> subsets. In addition to  $\alpha\beta$ T cells,  $\gamma\delta$ T cells expressing the mentioned TFs may also make up a proportion of our positively stained CD3<sup>+</sup> T cells. IL17producing yoT cells, termed yoT17, were found in several tumor entities, including HNSCC (51, 52). In further studies, we explored the frequency and phenotype of HNSCC-infiltrating T cells. In

comparison to a previous study on soft tissue sarcomas, that utilized a similar T cell staining procedure, HNSCC samples featured an obviously higher T cell infiltration (32). The investigated CD8<sup>+</sup> T cells showed significantly higher frequencies in TS. This finding is in line with the literature reporting a higher frequencies of stromal T lymphocytes compared to IET-lying ones (53). However, significantly greater proportions of CD8<sup>+</sup> T cell subpopulations, expressing further co-stimulatory and/or co-inhibitory marker proteins, were present in the IET compartment. In particular, a high expression of the co-inhibitory receptors PD-1 and LAG-3 by CD8<sup>+</sup> T cells, either alone or in combination, became obvious underlining the described loss of effector function and exhaustion state of tumor-infiltrated CD8<sup>+</sup> T cells (5).

Following previous approaches, we incorporated several clinicopathological parameters in our analysis that appear important for the progression of HNSCC and treatment response, such as tumor grading, p16 status, and hypoxia, and assessed them in conjunction with immune cell infiltrate patterns. First, we explored the relationship between the immune landscape and tumor grading. While Boucek et al. described a positive association between tumor histological grading and elevated CD8<sup>+</sup> T cell levels in the blood of HNSCC patients at diagnosis (54), we observed a positive correlation between tumor grading and exhausted CD8<sup>+</sup> T cells (PD-1<sup>+</sup>LAG-3<sup>+</sup>CD8<sup>+</sup>) within the IET compartment of the Hypox15<sup>low</sup> subcohort. This finding is in line with the literature describing a correlation of high LAG-3 expression and high pathological grade (55). Further, a higher grading (G3) was frequently accompanied by a higher proportion of stromal ROR $\gamma$ T<sup>+</sup> T<sub>H</sub>17 cells. A high infiltration of T<sub>H</sub>17 cells in HNSCC was confirmed by others, hypothesizing on a contribution to cancer progression (21).

Growing evidence has shown that two factors, namely tumor localization and HPV status, split HNSCC into greatly different subentities, characterized by distinct clinical and therapeutic outcomes (7). Recognition of HPV-related HNSCC as a distinct entity from the HPV-unrelated cases emerged from differences observed in their molecular profiles, tumor development process, clinical presentation, and outcome. This led to a novel staging system for the HPV+ oropharyngeal squamous cell carcinoma in the latest edition of the TNM classification of the Union for International Cancer Control (UICC) (56). The immune contexture, which differs among HNSCC localizations and between HPV+ and HPV- tumors, might represent a pivotal player in shaping these differences. Multiple groups have reported an enhanced infiltration of CD8<sup>+</sup> T lymphocytes in p16+ HNSCC, that correlated positively with clinical outcome (14, 24, 47, 57, 58). In addition to high CD3<sup>+</sup> and CD8<sup>+</sup> T cell densities as well as CD8: T<sub>reg</sub> ratio in HPV+ tumors shaping a less immunosuppressive TME as detected in multiple studies (41), we showed that both cDC subtypes (cDC1 and cDC2) had significantly higher frequencies in p16+ vs. p16- tumor samples, primarily in the IET compartment. Similarly, researchers reported a higher infiltration of HPV+ oropharyngeal tumors by a specific CD11c<sup>+</sup> cDC population compared to the HPV- counterparts (59). Using the TCGA database, Gameiro et al. observed that activated DC transcript levels tend to be higher in HPV+ vs. HPV- tumors, but without reaching significance (60). However, also contradictory results are reported being not able to draw a link between DC frequencies and HPV status or even detecting lower DC amounts in HPV-related tumors (41, 59). Additionally, increased proportions of exhausted T cells (PD-1<sup>+</sup>CD8<sup>+</sup>, PD-1<sup>+</sup>LAG-3<sup>+</sup>CD8<sup>+</sup>), cytotoxic T cells (PD-1<sup>+</sup>GrzB<sup>+</sup>CD8<sup>+</sup>), proliferating T cells (PD-1<sup>+</sup>Ki67<sup>+</sup>CD8<sup>+</sup>), and GATA3<sup>+</sup> T<sub>H</sub>2 cells in TS of patients with p16+ tumors were observed. Similarly to our quantified stainings, HPV-related HNSCC are ascertained to exhibit high expression levels of checkpoint receptors, including PD-1 and LAG-3, underlining a linkage of HPV infection and T cell exhaustion (53, 61, 62). Further, Kansy et al. reported significantly increased fractions of cytotoxic T cells (GrzB<sup>+</sup>CD8<sup>+</sup>) and proliferating T cells (Ki67<sup>+</sup>CD8<sup>+</sup>) in the TS of 27 HPV+ oropharyngeal tumor patients analyzed by multi-color immunofluorescence (63).

Hypoxia is a major factor that shapes the TME and also the response of HNSCC to radiotherapy by regulating i) the survival, proliferation, differentiation, and antitumor capacity of T cells; ii) the survival, migration, antigen presentation, and differentiation of DCs; or iii) the macrophage polarization and tumor development, among others (64, 65). In HNSCC, Kim et al. observed that the level of hypoxia varies across anatomical locations, with tumors in the larynx being less hypoxic than those in the oral cavity, and those in the oropharynx being the most hypoxic ones (66). In our HNSCC cohort, significant lower infiltration of cDC1 cells (IET) and cytotoxic GrzB<sup>+</sup>CD8<sup>+</sup> T cells (TS) in tumors with hypoxiaassociated gene signatures was measurable. According to the literature, hypoxia might diminish the infiltration and activity of DCs as well as T lymphocytes (67, 68) confirming our results. Especially in the p16+ subcohort, additional significant differences were noticeable, as these patients exhibited also a lower proportion of T-bet<sup>+</sup> T<sub>H</sub>1 cells and a concomitantly higher infiltration of T<sub>regs</sub> in Hypox15<sup>high</sup> tumors being independent of the investigated tumor compartment. It is reported that immunosuppressive immune cells, like T<sub>regs</sub>, infiltrate hypoxic regions in HNSCC supporting our results (69).

Besides correlating immune cell infiltrate patterns with clinical parameters, the association of immune cell populations and patient survival was a major research objective of this study. By means of TCGA datasets, Mito et al. showed a lymphocyte gene expression signature that predicts prolonged OS, whereas a myeloid/DC signature indicated lower survival propabilites (5). This suggests that the myeloid compartment favors immune suppression and tumor growth in HNSCC, but its role has not been clearly dissected so far. In our cohort, patients with Hypox15<sup>low</sup> HNSCC and a high stromal infiltration of IRF7<sup>+</sup> pDCs displayed significantly shortened OS and LDMC. The correlation of pDC abundancy and poor prognosis is described for many cancer entities including HNSCC (41, 43). In other studies, pDC infiltration correlated with a high expression of FoxP3 and co-inhibitory markers (PD-1 and LAG-3) setting up an immunosuppressive TME and promoting tumor progression (70, 71). Additionally, positive correlations of especially cDC1 infiltration and, to a lesser extent, cDC2 frequency with favorable LDMC surfaced in our investigation. This fits and adds to the existing knowledge on cDC1s forming clusters with CD8<sup>+</sup> T cells in the TS compartment of HNSCC

patients and, thus, being capable to induce CD8<sup>+</sup> T cell-mediated antitumoral responses, which in turn correlated with high LDMC in these patients (72). However, we report the positive role of cDC1s in HNSCC by detecting the subset-specific CLEC9A molecule at protein level. Our findings on cDC2s are in line with current literature describing an association of cytokine-producing CD163<sup>+</sup> cDC2 cells or cDC2, expressing programmed cell death ligand-1 (PD-L1)<sup>high</sup> and inducible T cell co-stimulator ligand (ICOSL)<sup>low</sup>, with favorable survival (73, 74).

Regarding an association of T cell subpopulations with clinical outcome, studies resulted in contradictory findings. On the one hand, CD4<sup>+</sup> T cells were significantly associated with longer OS and disease-specific survival (75), but on the other hand most research did not observe significant correlations of CD4<sup>+</sup> infiltration and patient prognosis (41, 61). In our p16- subcohort, the infiltration of ROR $\gamma$ T<sup>+</sup> T<sub>H</sub>17 cells and FoxP3<sup>+</sup> T<sub>regs</sub> were linked to favorable OS/ LDMC and OS, respectively. While T<sub>H</sub>17 infiltration was associated with an improved prognosis of patients with HPV+ HNSCC (21), the current literature is balanced between studies reporting positive and negative impacts of T<sub>reg</sub> infiltration on survival. Thereby, contradictory reports exist for both different HNSCC locations and for HPV-dependencies (41, 76, 77). Nevertheless, studies agreed on the relation of high CD8+ T cell infiltration and a positive impact on HNSCC patients' survival (61, 78). Likewise, a higher frequency of CD8<sup>+</sup> T lymphocytes as well as an elevated CD8:T<sub>reg</sub> ratio correlated significantly with higher LRC and LDMC in our study. However, regarding the relation of CD8:T<sub>reg</sub> ratio and survival properties of HNSCC patients, contradictory studies exist mentioning an adverse association (41, 79), no association or a favorable association (80, 81). A possible explanation for the inconclusive study situation was provided by Echarti et al. (82). In their investigation, the authors found a high T<sub>reg</sub> infiltration to diminish OS in "immune desert" and "immune excluded" HNSCC, but a prolonged OS was seen in high T<sub>reg</sub>-infiltrated "inflamed" tumors. When assessing CD8<sup>+</sup> subpopulations and their association with survival parameters of our cohort, cytotoxic GrzB<sup>+</sup>CD8<sup>+</sup> T cells are unfavorable concerning clinical outcome for patients with Hypox15<sup>high</sup> tumors, whereas for patients with Hypox15<sup>low</sup> tumors the infiltration of active cytotoxic T cells seems to be linked to good survival. It is known that the hypoxic TME evades immune cellmediated killing mechanisms by activating autophagy, forming autophagosomes, and neutralizing/degrading cytotoxic mediators, like GrzB (83). Additionally, whole tumor infiltration of PD-1<sup>+</sup>CD8<sup>+</sup> T cells was associated with prolonged OS in the Hypox15<sup>low</sup> subcohort and displaying a similar trend in the whole cohort, too. According to the literature, a high frequency of PD-1<sup>+</sup>CD8<sup>+</sup> T cells was linked to favorable OS in patients with HPV-HNSCC, whereby the 25<sup>th</sup> lowest percentile of these immune cell infiltrate pattern was used for grouping the patients (84).

When evaluating the clinical outcome of HNSCC patients according to p16 status in combination with immune cell infiltrate pattern of pDCs, cDC1, cDC2, CD3<sup>+</sup>, and CD8<sup>+</sup> T cells, four subgroups can be classified: p16+/immune<sup>high</sup>, p16+/immune<sup>low</sup>, p16-/immune<sup>high</sup>, and p16-/immune<sup>low</sup>. In our investigation, especially patients with p16+ HNSCC and high immune cell infiltrate exhibited significantly better clinical outcomes in

comparison to both p16- subgroups and tendentially prolonged survival compared to patients with p16+ HNSCC and low immune cell infiltrate. In literature, patients with HPV+ HNSCC and high infiltration of CD8<sup>+</sup> T cells showed most favorable survival parameters (85) fitting our observations. Similarly, in terms of combined hypoxia/immune phenotype profiles different subgroups might be distinguished: hypoxia<sup>low</sup>/immune<sup>high</sup>, hypoxia<sup>high</sup>/ immune<sup>low</sup>, hypoxia<sup>low</sup>/immune<sup>low</sup>, and hypoxia<sup>high</sup>/immune<sup>high</sup>. The last two phenotypes mentioned are also referred as a mixed or intermediate phenotype. In this regard, different investigators showed that the hypoxia<sup>low</sup>/immune<sup>high</sup> phenotype was indicative of enhanced survival rates based on hypoxia- and immune responserelated gene expression analysis of TCGA datasets or immunohistochemical staining of T cell (CD3) and hypoxia markers (carbonic anhydrase IX) (11, 86-88). In our study, we confirmed the positive association of the hypoxia<sup>low</sup>/immune<sup>high</sup> phenotype with favorable clinical outcome of HNSCC patients. Though, different from the studies mentioned above, our phenotype clustering based on Hypox15 gene signature to determine the hypoxia status as well as on multiplex immunohistochemical staining combined with semi-automatic quantification of DCs and T cells at protein level to identify the immune cell infiltrate. In sum, favorable survival of patients with p16+ or Hypox15<sup>low</sup> HNSCC seems to be particularly associated with a high infiltration of DCs and T cells. Thus, patients with p16+/immunelow and Hypox15<sup>low</sup>/immunelow HNSCC might benefit from therapeutically increased immune cell infiltrate.

Moreover, the infiltration of CLEC9A<sup>+</sup> cDC1 and CD8<sup>+</sup> T cells emerged as independent prognostic markers for improved clinical outcome besides clinicopathological parameters, like T stage, p16 status, and tumor localization, as shown in the multivariate Cox regression and our developed ICIS. By using a TCGA dataset of 497 HNSCC tissue samples, Liu et al. identified a significant association of CLEC9A gene and OS (univariate hazard ratio [HR]: 0.876, multivariate HR: 0.906) (89). Moreover, Furgiuele et al. reported CD8<sup>+</sup> density to be an independent prognostic marker and an deduced ICIS, comprising tumor infiltration of T lymphocytes (CD8<sup>+</sup>, T<sub>regs</sub>) and macrophages (CD68<sup>+</sup>), improved HNSCC patients' prognosis (90). Therefore, in the context of the still ongoing implementation of an ICIS for HNSCC (90, 91), cDC1 and CD8<sup>+</sup> T cells are promising candidates for an ICIS to predict the clinical outcome of HNSCC patients.

# **5** Conclusion

In our study, we comprehensively investigated HNSCC infiltration patterns of several DC subtypes and T cell subpopulations, with respect to their phenotype and spatial distribution. The stromal tumor compartment is highly infiltrated by pDCs and T lymphocytes, with  $T_{regs}$  and exhausted CD8<sup>+</sup> T cells being the predominant phenotypes and shaping an immunosuppressive tumor immune architecture. HPV-associated tumors showed significantly higher infiltration of several investigated immune cell populations, whereby tumors with hypoxia-associated gene signatures exhibited reduced infiltration. Furthermore, our

study contributes to the identification of novel prognostic biomarkers for HNSCC, as especially cDC1 and CD8<sup>+</sup> T cells were independent prognostic factors for clinical outcome and potentially contribute to the evaluation of a novel and more precise ICIS. These parameters may help to further stratify patient subgroups in need of treatment escalation. If confirmed in a validation cohort, combined treatment approaches with enhancing tumor perfusion (using hyperthermia, irradiation, potentially particle therapy) and immune checkpoint inhibitor therapy in high-risk tumors may be subject of future investigations. In patients with HNSCC receiving primary R(C)Tx, pretherapeutic diagnostic approaches with functional imaging such as <sup>18</sup>F-fluoromisonidazol positron emission tomography (18F-FMISO PET) to detect hypoxic tumor areas and combining these findings with an ICIS based on the analysis of biopsy material could add prognostic information and lead to further individualized treatment strategies. This might improve the design of future radiochemo(immuno)therapy.

# Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material. Further inquiries can be directed to the corresponding authors.

# Ethics statement

The studies involving humans were approved by Ethics Committee of Technische Universität Dresden. The studies were conducted in accordance with the local legislation and institutional requirements. The participants provided their written informed consent to participate in this study.

# Author contributions

JK: Conceptualization, Writing - original draft, Writing review & editing, Data curation, Formal analysis, Investigation, Methodology, Resources. IP: Conceptualization, Data curation, Formal analysis, Investigation, Methodology, Writing - original draft, Writing - review & editing. RR: Conceptualization, Data curation, Formal analysis, Investigation, Methodology, Writing original draft, Writing - review & editing, Visualization. AR: Conceptualization, Data curation, Formal analysis, Investigation, Methodology, Visualization, Writing - original draft, Writing review & editing. SL: Data curation, Formal analysis, Investigation, Methodology, Visualization, Writing - original draft, Writing review & editing. IB: Data curation, Formal analysis, Investigation, Methodology, Writing - original draft, Writing - review & editing. LR: Data curation, Formal analysis, Investigation, Methodology, Writing - original draft, Writing - review & editing. AL: Writing original draft, Writing - review & editing, Funding acquisition, Resources. RW: Writing - original draft, Writing - review & editing, Funding acquisition. MK: Funding acquisition, Writing original draft, Writing - review & editing, Resources. MS: Funding acquisition, Writing - original draft, Writing - review & editing, Conceptualization.

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# Conflict of interest

In the past 5 years, MK received funding for her research projects by Merck KGaA 2014-2018 for preclinical study; 2018-2020 for clinical study and Medipan GmbH 2014-2018. MK and AL are involved in an ongoing publicly funded German Federal Ministry of Education and Research project with the companies Medipan 2019-2022, Attomol GmbH 2019-2022, GA Generic Assays GmbH 2019-2022, Gesellschaft für medizinische und wissenschaftliche genetische Analysen 2019-2022, Lipotype GmbH 2019-2022 and PolyAn GmbH 2019-2022. MK and AL confirm that, to the best of their knowledge, none of the above-mentioned funding sources were involved in the preparation of this paper.

The remaining authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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# Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fimmu.2024.1414298/ full#supplementary-material

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